

# GE Security

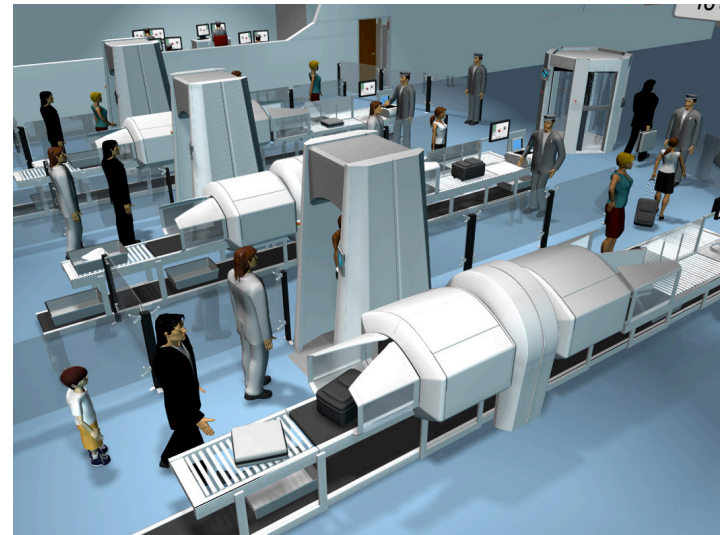
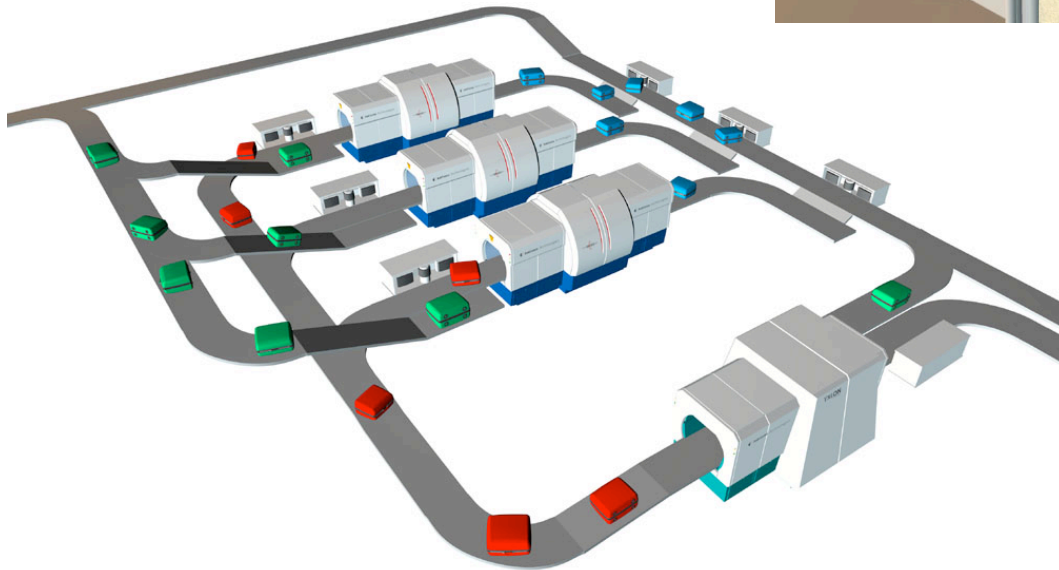
## Building Checkpoints of the Future using Sensor Fusion

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imagination at work

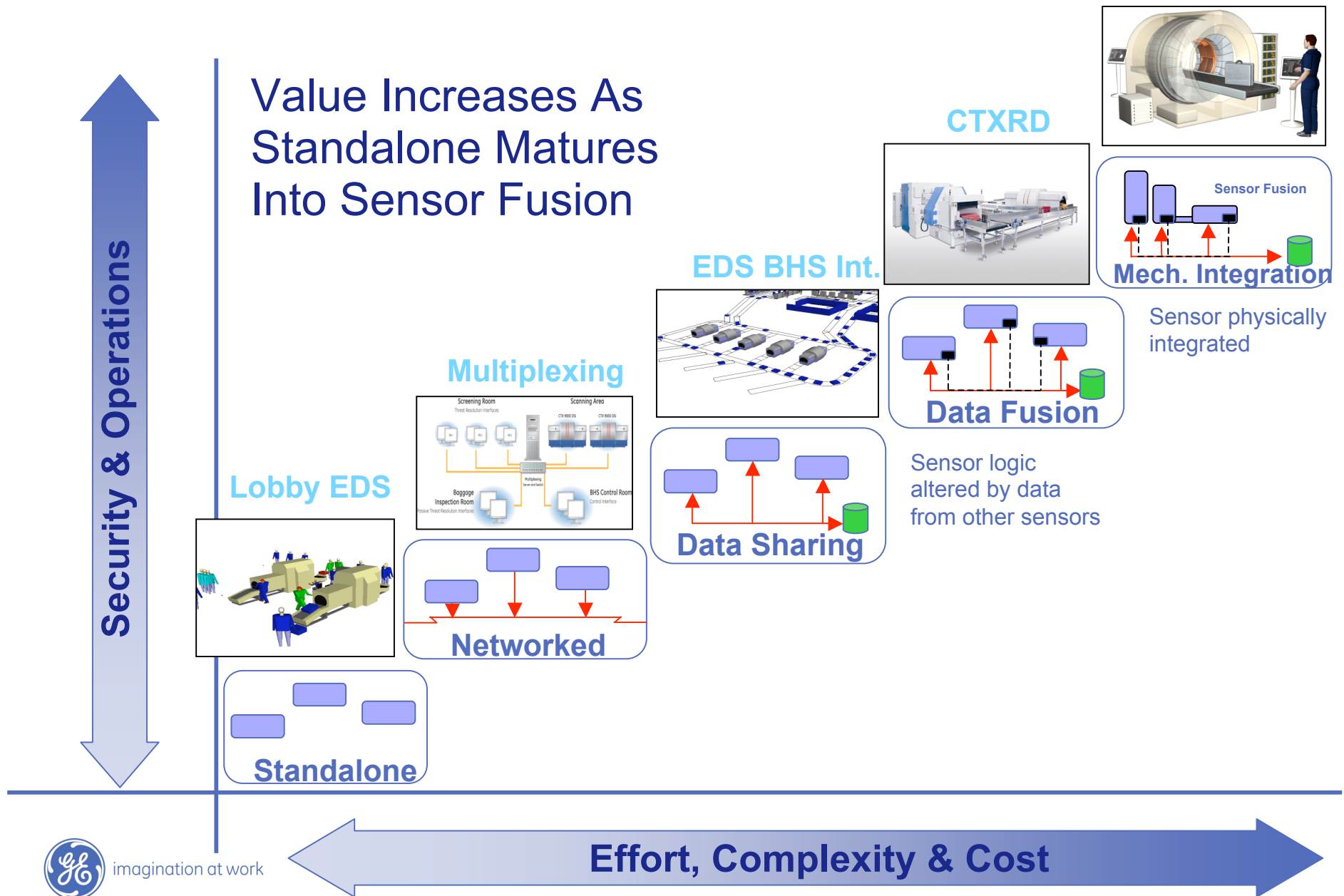
# Where is Sensor Fusion Going?



# SRT Kiosk Concept of Operations



# Modalities of Sensor Integration



# A Generic Example to Explain Sensor Fusion

## The “Apple Detection System” (ADS)

- **The Purpose:**

Find apples in a population of plastic balls, tomatoes, pears, apples, oranges, etc.

- **Main Features:**

The ADS has two orthogonal sensors

Sensor A = Image based; uses shape recognition.

Sensor B = Chemical; PH sensor detecting apple acidity level.



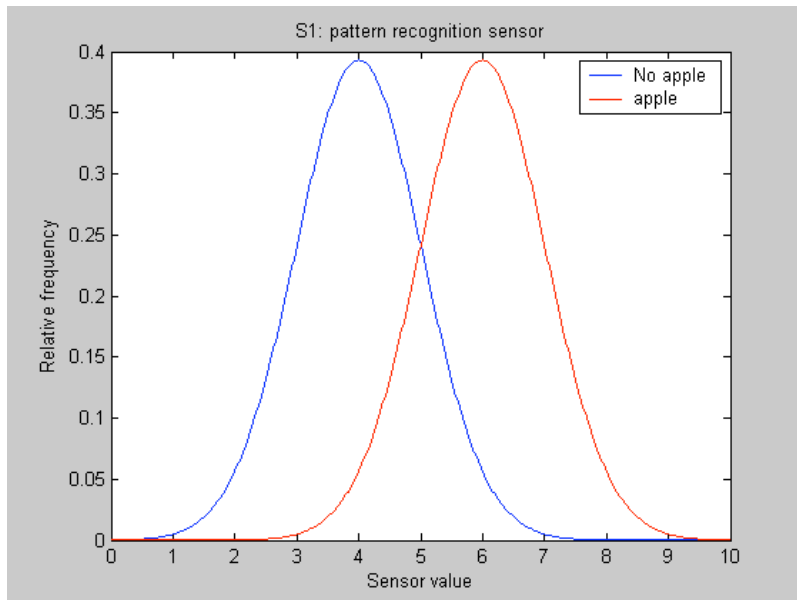
### Orthogonal Sensors

Scanners employ Orthogonal sensors when they measure different characteristics of the targets in order to determine the presence of explosives.

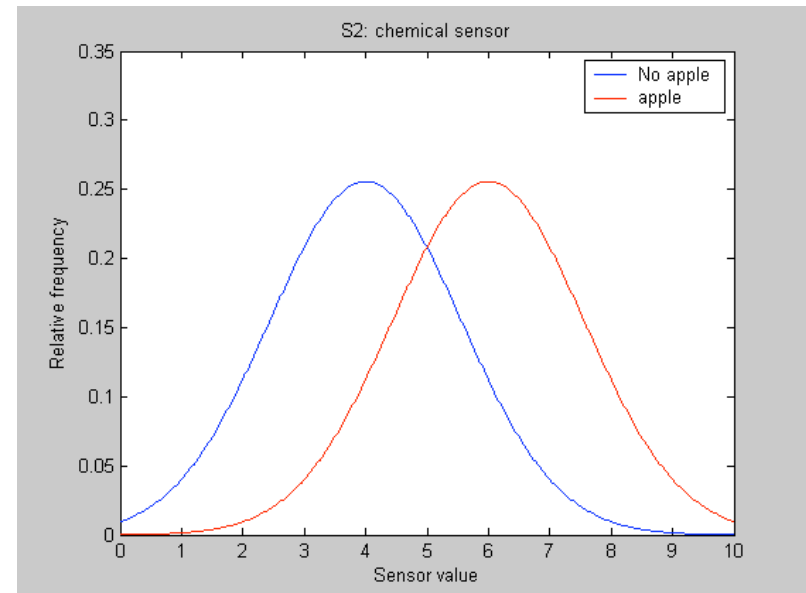
# Studying Sensor behavior

- Each sensor generates a reading between 0 –10.
- Statistical data was collected, for each sensor individually, to create apples and non-apple population curves.

Sensor A:  
Image



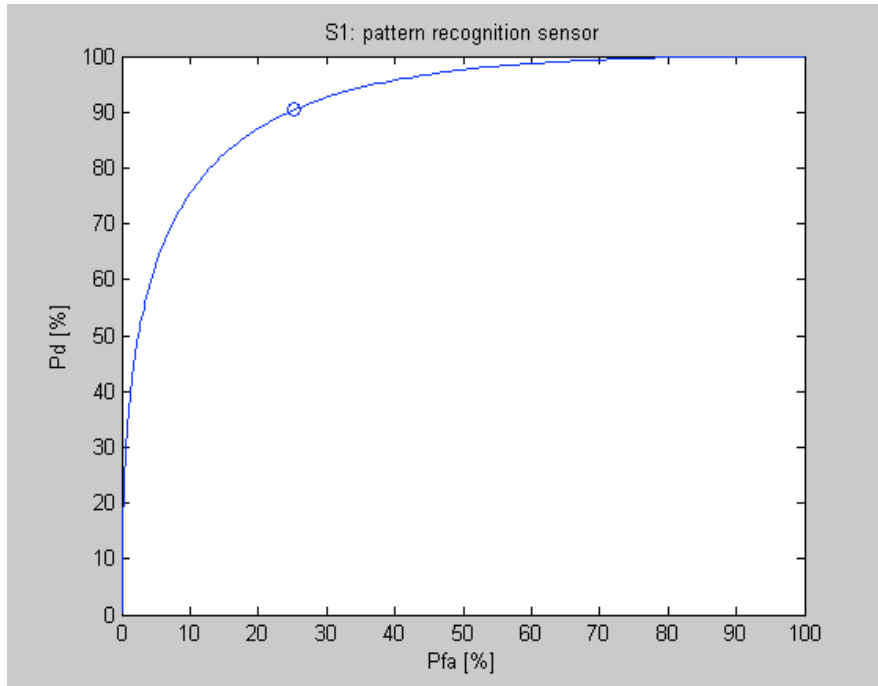
Sensor B:  
Chemical



# Testing

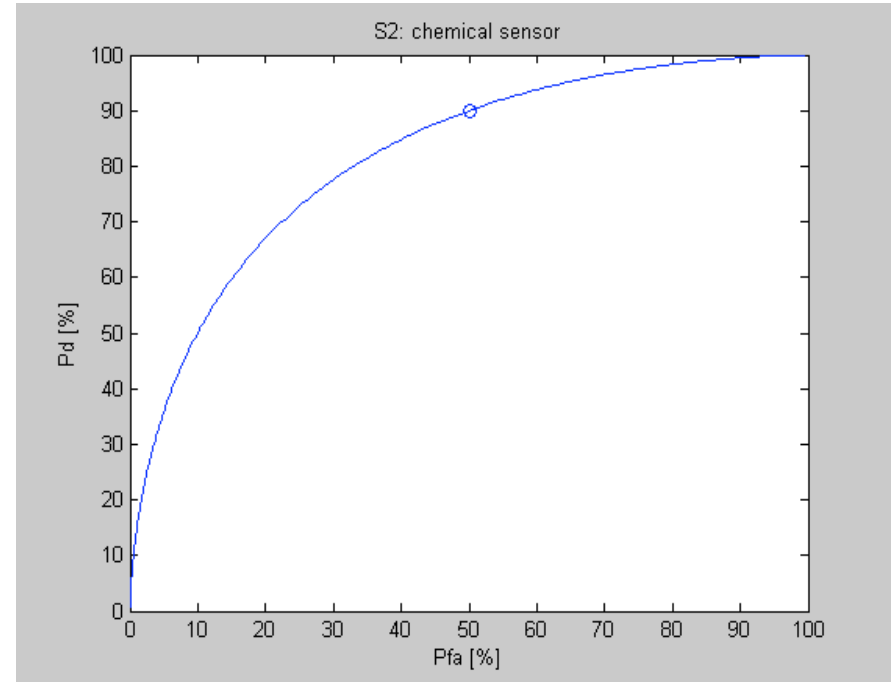
- Tests were conducted and the performance characteristics of Sensor A and Sensor B have been recorded.

Sensor A:  
Image



$Pd = 90\%$     $Pfa = 25\%$

Sensor B:  
Chemical

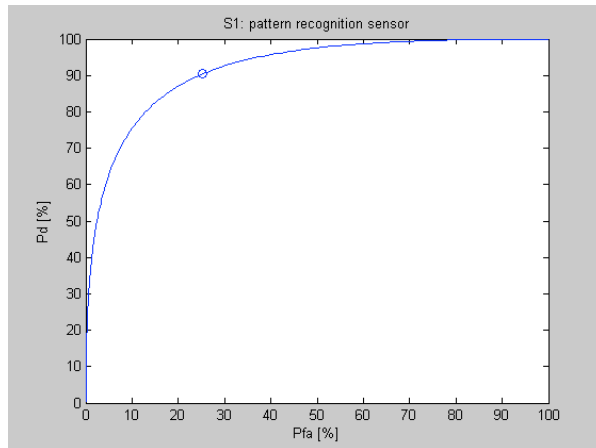


$Pd = 90\%$     $Pfa = 50\%$

# Option 1

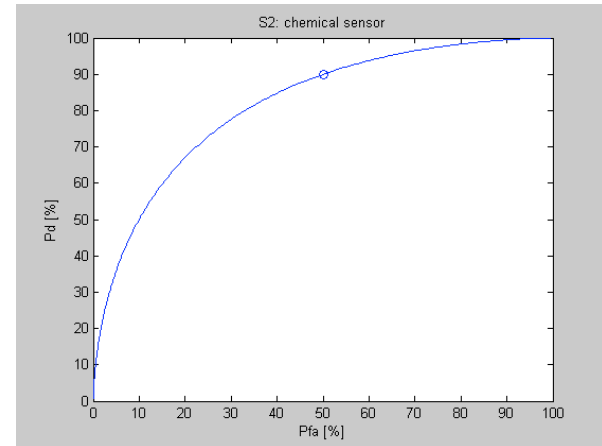
Use Sensors Individually and Independently

Sensor A:  
Image



$Pd = 90\%$     $Pfa = 25\%$

Sensor B:  
Chemical



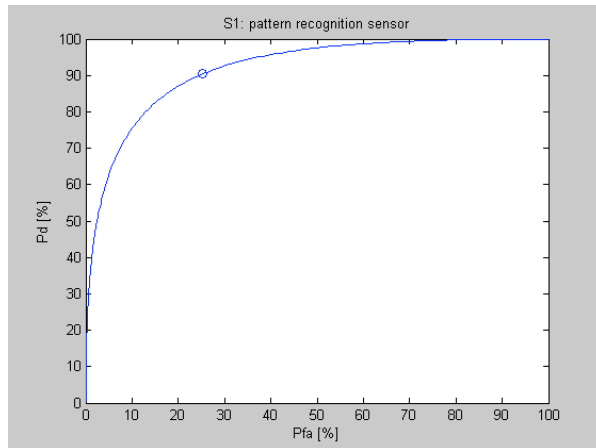
$Pd = 90\%$     $Pfa = 50\%$



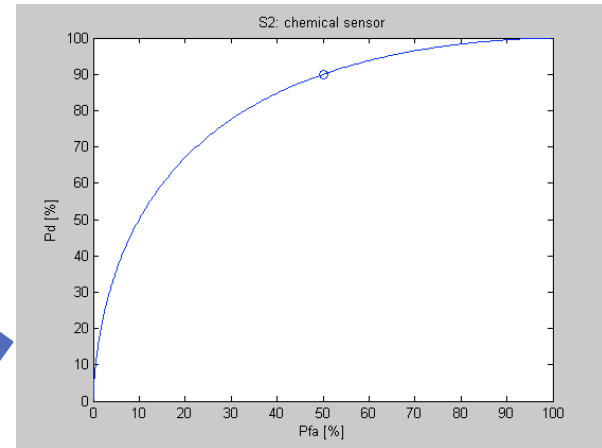
# Option 2

Combine Sensor A and Sensor B with an “AND” Boolean

Sensor A:  
Image



Sensor B:  
Chemical



AND

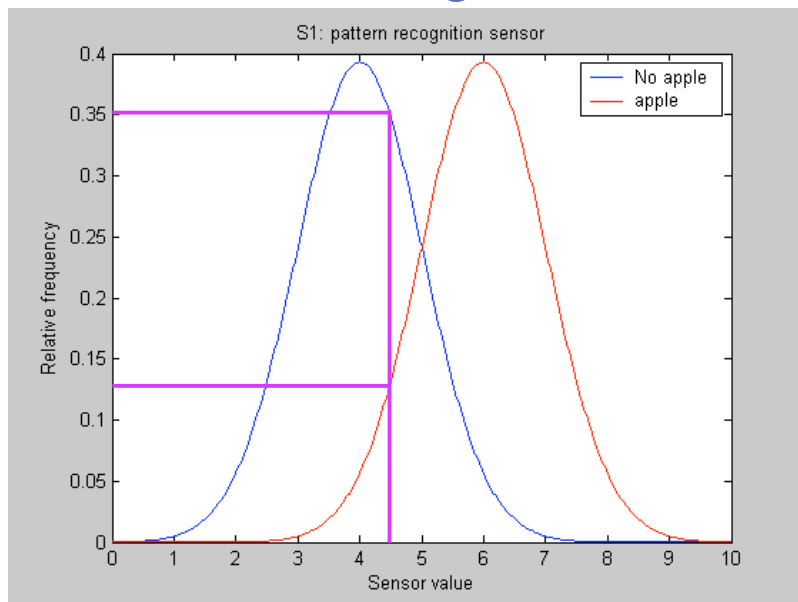
$$Pd = 90\%_{S1} \times 90\%_{S2} = 81\%$$

$$Pfa = 25\%_{S1} \times 50\%_{S2} = 12.5\%$$

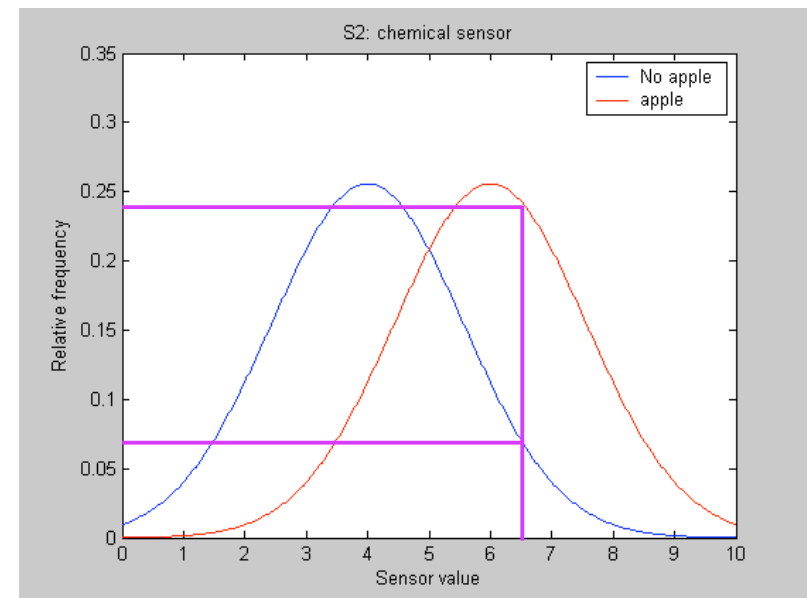
# Option 3

## Employ Data Fusion (Example: Bayesian)

Sensor A:  
Image



Sensor B:  
Chemical



$$P(\text{Apple} \mid S1, S2) =$$

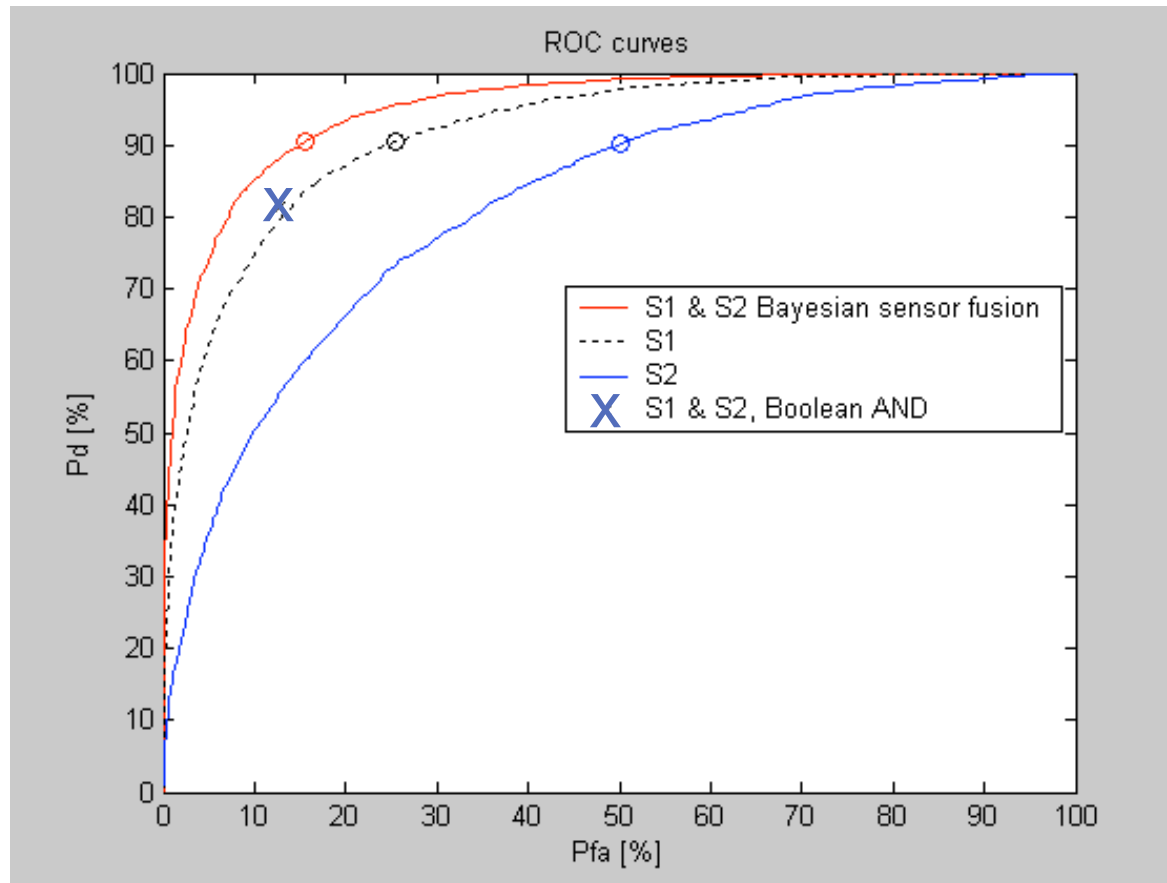
$$\frac{P(S1 \mid \text{Apple})P(S2 \mid \text{Apple})P(\text{Apple})}{P(S1 \mid \text{Apple})P(S2 \mid \text{Apple})P(\text{Apple}) + P(S1 \mid \text{Other})P(S2 \mid \text{Other})P(\text{Other})}$$

$$P(S1 \mid \text{Apple})P(S2 \mid \text{Apple})P(\text{Apple}) + P(S1 \mid \text{Other})P(S2 \mid \text{Other})P(\text{Other})$$

## Option 3 (continued)

### Employ Data Fusion

ROC  
curve of  
data  
fusion:



Pd = 90%  
Pfa = 14%

# Performance Comparison Table

Method	Pd%	Pfa%
Image Sensor	90	25
Chemical Sensor	90	50
“AND” Boolean	81	12.5
Bayesian Sensor Fusion	90	14



# Sensor Fusion – Where is the Hardware?

## Sequential Propagation

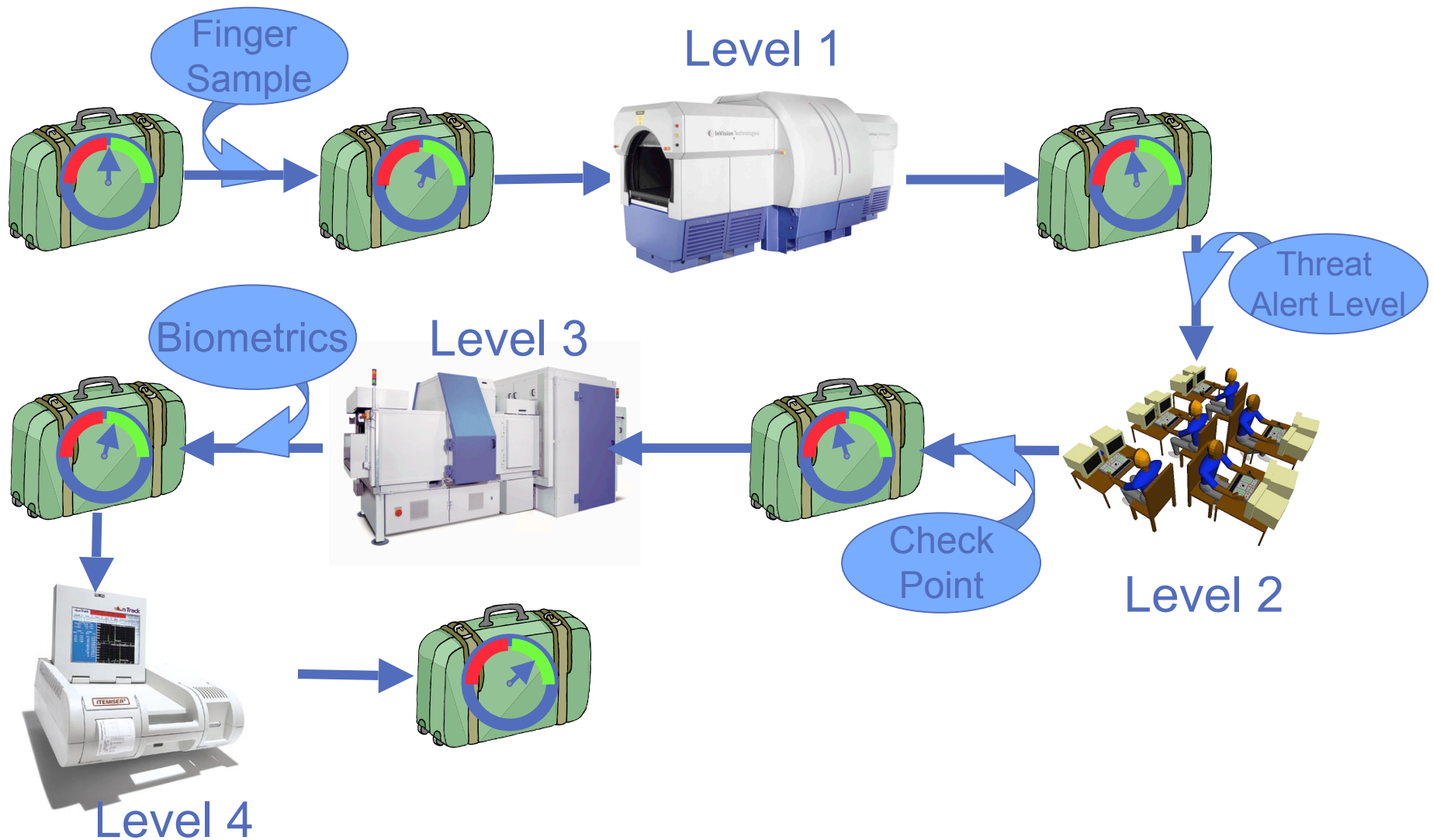
- ✎ Solve equation for each sensor separately
- ✎ Then “feed” the result to the next sensor to include in next steps of sensor fusion
- ✓ “DSFP” communications protocol

$$P(B | X) = \frac{P(X | B)P(B)}{P(X | B)P(B) + P(X | \bar{B})P(\bar{B})}$$

- “Threat Probability Meter”



# Implementing Sensor Fusion





# GE Security

Thank You



imagination at work